

# **Fifth Annual Conference on Carbon Capture & Sequestration**

## *Steps Toward Deployment*

*Geologic – Monitoring, Mitigation, and Verification*

### **A Statistical Algorithm to Detect and Quantify CO<sub>2</sub> Leakage for the Verification of Geologic Carbon Sequestration**

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# A Statistical Algorithm to Detect and Quantify Near-Surface CO<sub>2</sub> Leakage for Verification of Geologic Carbon Sequestration

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# Motivation

- Monitoring of CO<sub>2</sub> storage sites must be carried out to verify that CO<sub>2</sub> is not leaking
- Meet challenge of detecting subtle leakage signals within background variability by...

# Strategy

- Integrating near-surface measurements of CO<sub>2</sub> fluxes or concentrations with statistical algorithm that enhances properties of the data that are associated with leakage, while reducing random background contributions

# Background vs. Leakage Signals: Differences

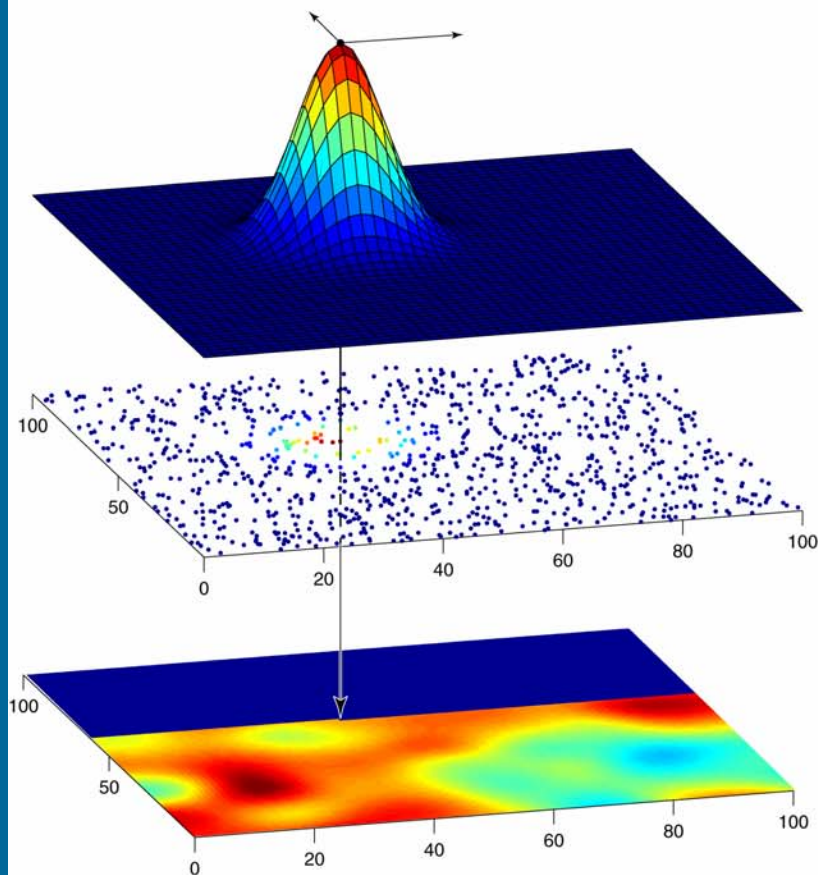
- High spatial heterogeneity of biological production
- Production correlated on predictable timescales
- Leakage (along well bore or fault) relatively coherent in space
- Leakage relatively constant

# Background vs. Leakage Signals: Similarities

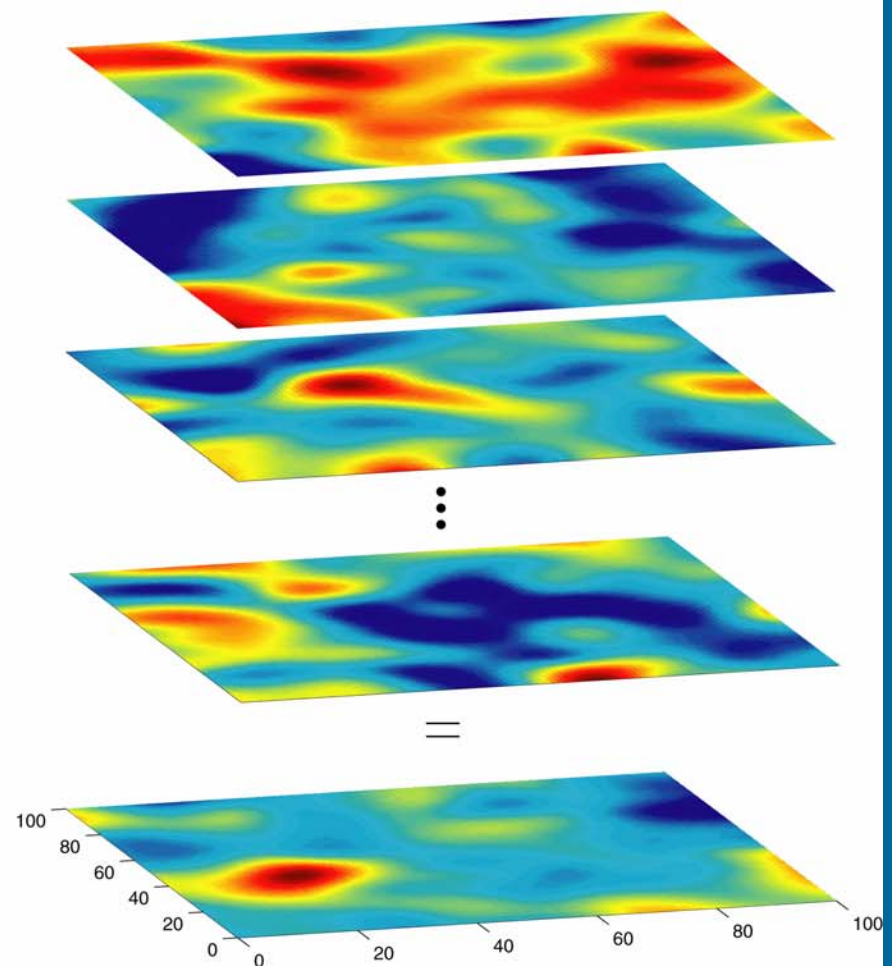
- Near-surface CO<sub>2</sub> fluxes/concentrations from both sources modified on predictable timescales
- These temporal variations can be removed from spatial flux/concentration datasets
- Areas of elevated spatial and temporal correlation in CO<sub>2</sub> associated with leakage can then be made more obvious

# Filtering and Stacking Method

**Filter in Space**



**Stack in Time**



# Surface CO<sub>2</sub> Flux Leakage Signals

- Two-dimensional scaled Gaussian distribution
- Modeled surface CO<sub>2</sub> fluxes associated with CO<sub>2</sub> leakage from well bore (point) and fault (line) sources using TOUGH2/T2CA



# Background Surface CO<sub>2</sub> Fluxes



- Background biological noise added to leakage signal and surrounding area ( $10^6 \text{ m}^2$ )
- Accumulation chamber method in grassland, central CA
- $n = 287$ , 5-m spacing grid, uncorrelated on this scale
- Diurnal fluctuations removed,  $\mu = 8.7 \text{ g m}^{-2}\text{d}^{-1} = F_B$

# Sampling and Processing Strategies

- Grid and random sampling strategies investigated
- In all cases, 100 fluxes sampled from the underlying synthetic data set during each repeat sampling campaign, Gaussian filtering applied to each of the repeat data sets, and fluxes temporally averaged at each interpolated grid point

# Strategy Success

$$f_{ME} = \sqrt{(LR_I - LR_C)^2 / LR_I}$$

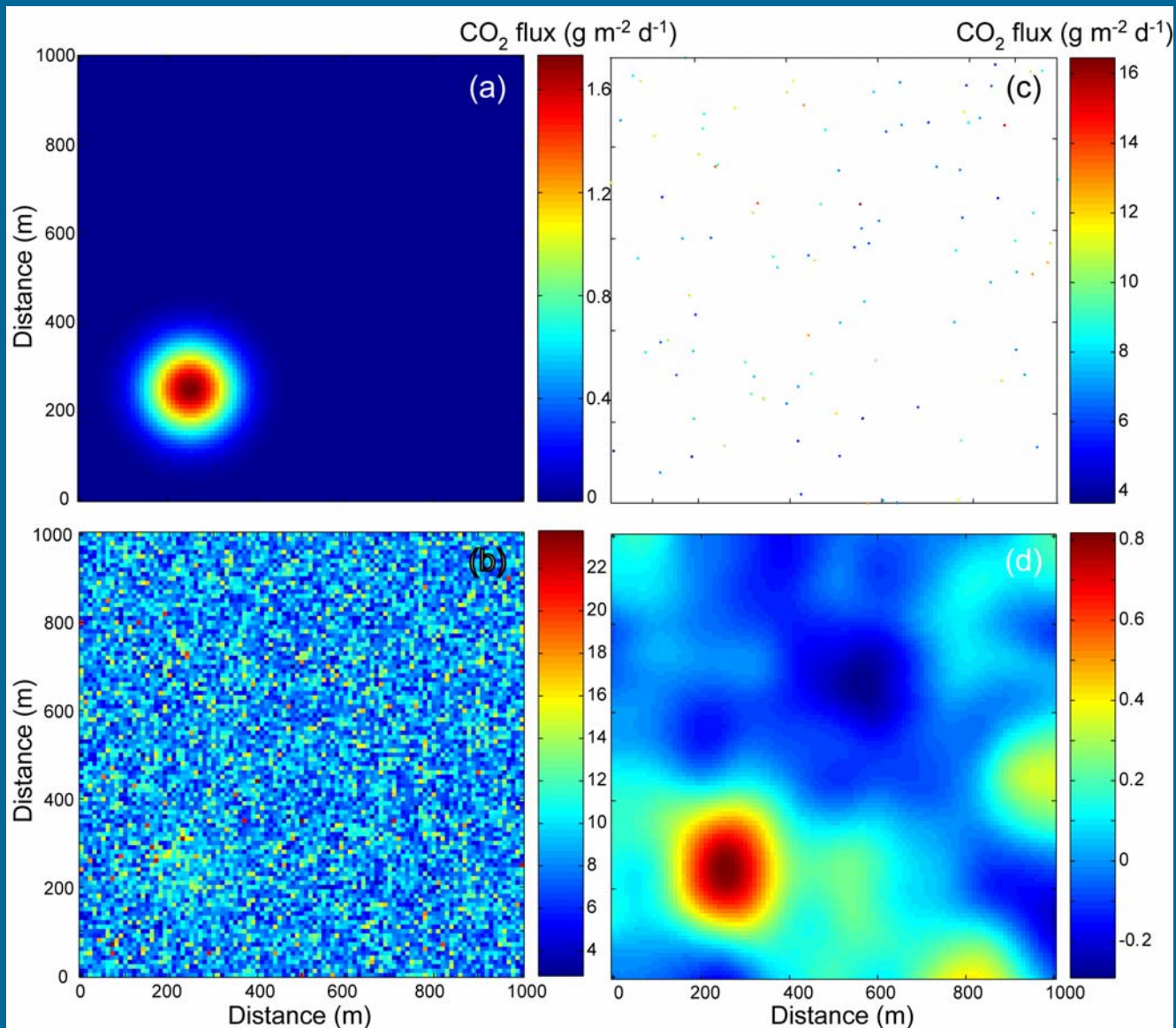
$LR_I$  = Imposed leakage rate

$LR_C$  = Calculated leakage rate

Leakage rate = spatially integrated  
flux of synthetic source

$f_{ME} \leq 0.5$ : "detectable" leakage signal

$f_{ME} > 0.5$ : "undetectable"

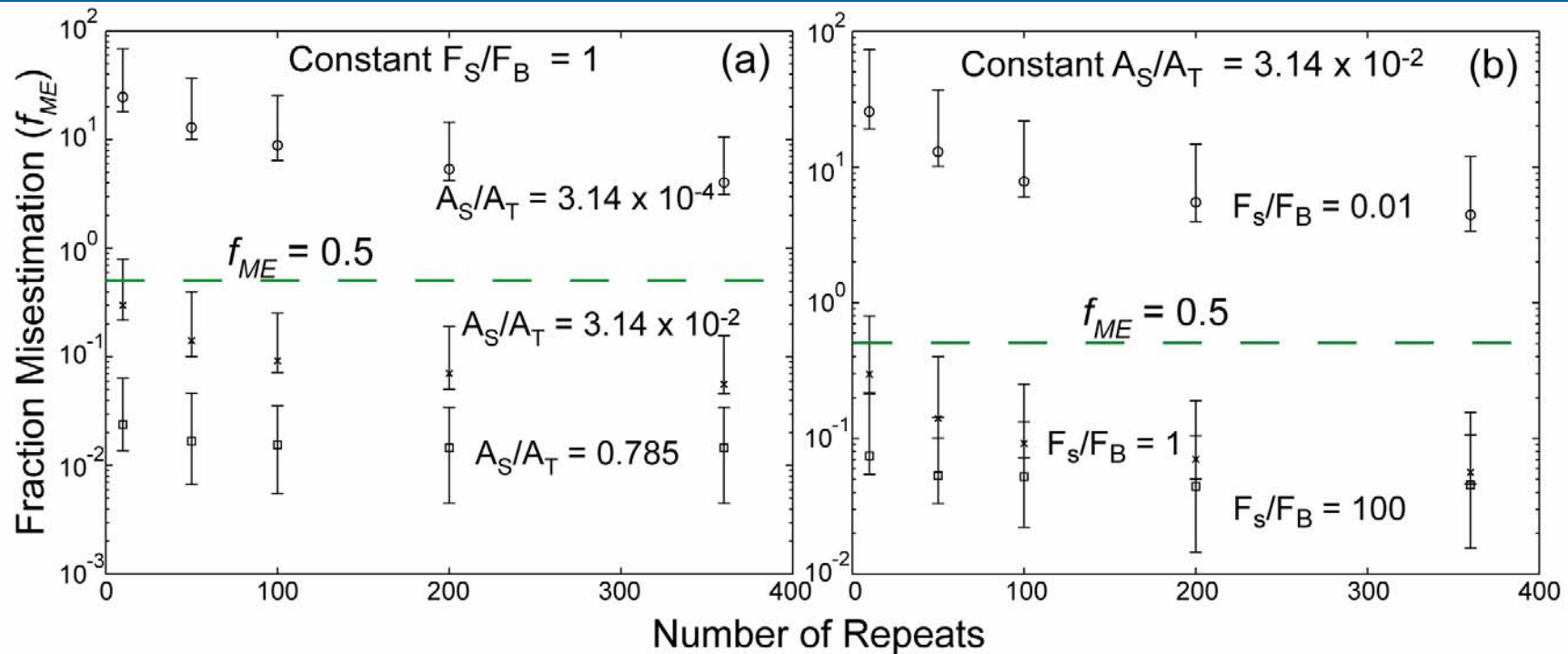


$F_B$  = average background flux = 8.7 g m<sup>-2</sup> d<sup>-1</sup>

$F_S$  = maximum leakage flux = 1.7 g m<sup>-2</sup> d<sup>-1</sup>

$R$  = Gaussian length scale = 100 m

$f_{ME} = 0.02$  for 100 repeat  
sampling campaigns



$R$  = Gaussian length scale

$L$  = model domain length = 1000 m

$R/L = 0.01, 0.1, 0.5$

$F_B$  = average background flux =  $8.7 \text{ g m}^{-2} \text{ d}^{-1}$

$$f_{ME} = \sqrt{(LR_I - LR_C)^2} / LR_I$$

$A_S$  = area of synthetic source

$A_T$  = area of model domain =  $10^6 \text{ m}^2$

$F_S$  = maximum leakage flux



# Conclusions

- Importance of maximizing  $A_S/A_T$  when  $F_S$  within the background variability of  $\text{CO}_2$  flux or when  $A_S$  is small (e.g., wells, mostly sealed faults/fractures)
- Method applies to other gas species and concentrations
- 10 to 50 repeat sampling campaigns (100 samples each) reasonable within a year

# Conclusions

- Assumptions of method
  - fluxes are statistically uniform over study area
  - leakage slowly evolving over period of observation
- Strategy provides means to locate and quantify potentially small CO<sub>2</sub> leakage signals within the natural background variability of CO<sub>2</sub>

# Acknowledgements

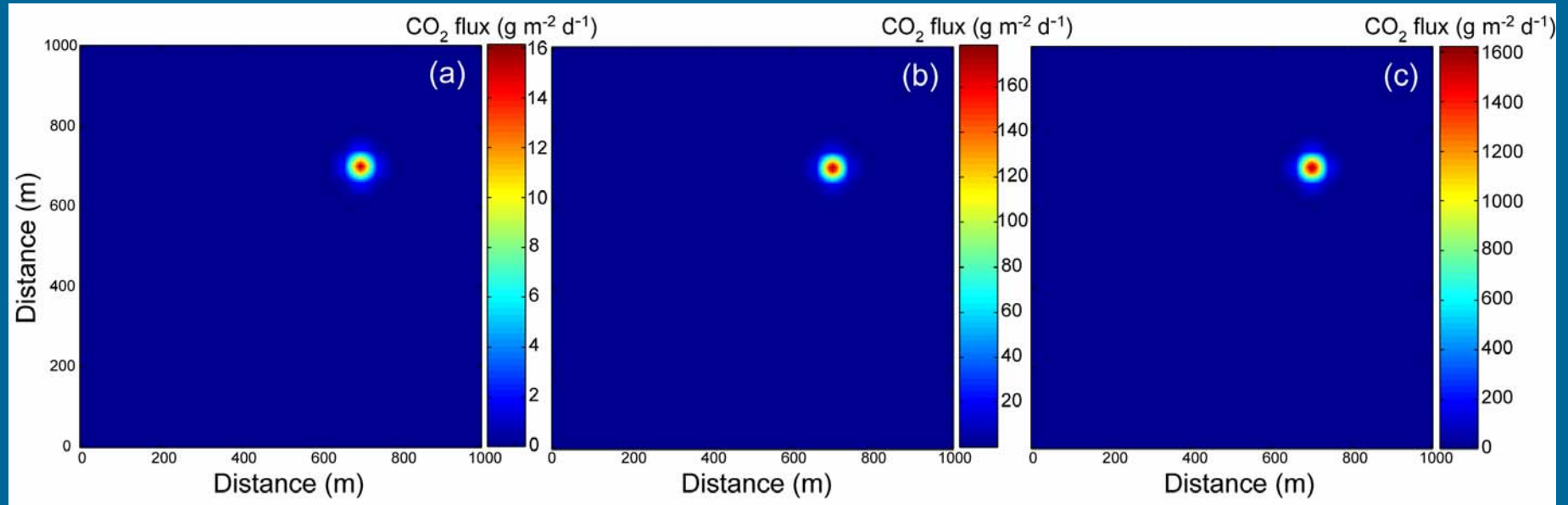
This work was supported in part by a Cooperative Research and Development Agreement between BP Corporation North America, as part of the CO<sub>2</sub> Capture Project, and the U.S. Department of Energy through the National Energy Technologies Laboratory, and by the Ernest Lawrence Berkeley National Laboratory, managed for the U.S. Department of Energy under Contract No. DE-AC03-76SF00098.



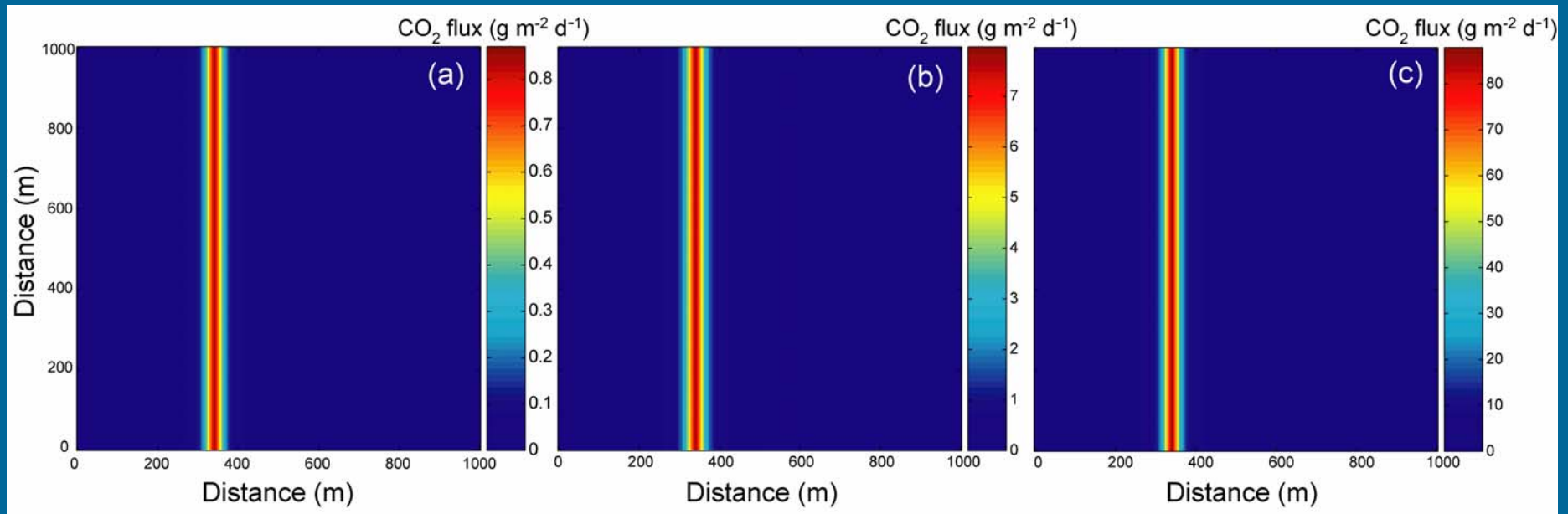
# Vadose Zone Model

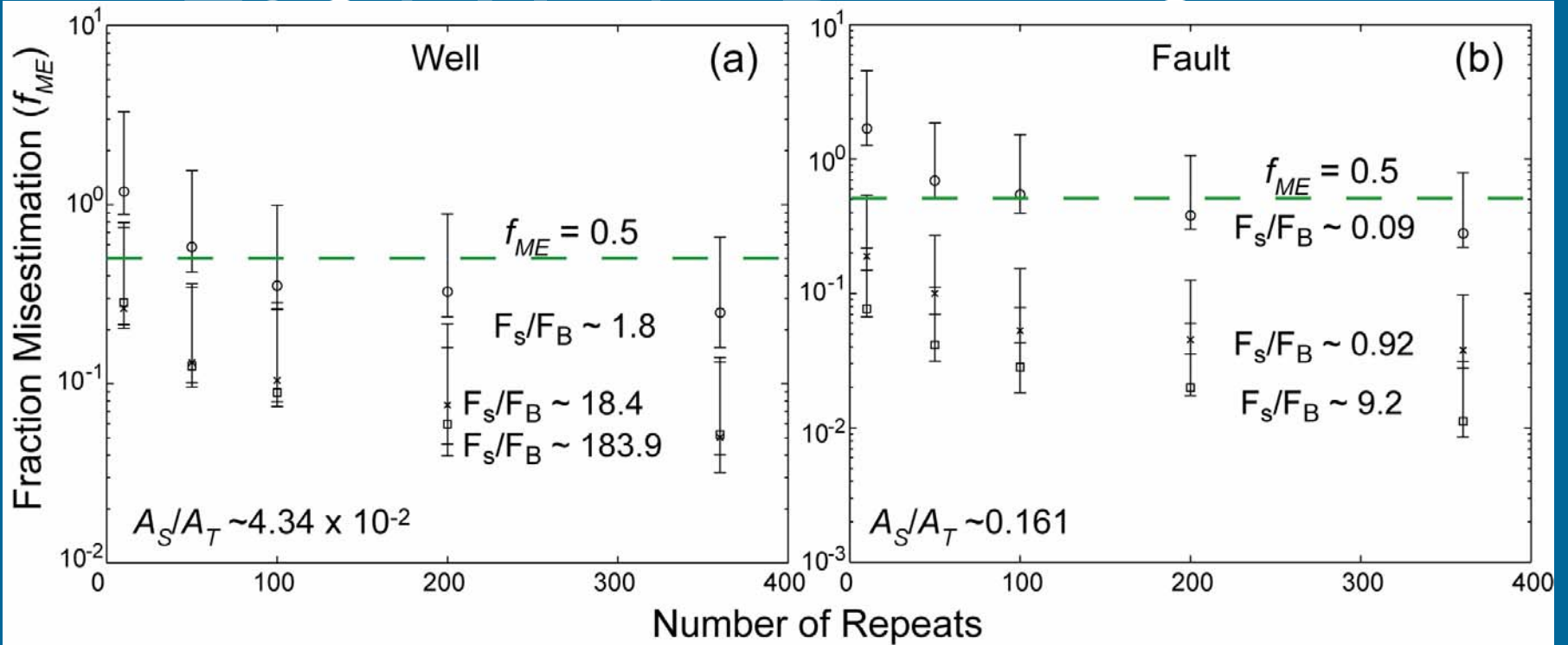
- **Subsurface:** 1000 m x 1000 m x 28 m,  $k = 1 \times 10^{-12} \text{ m}^2$ ,  $n = 0.2$ ,  $T = 15^\circ\text{C}$
- **Well** source geometry: 1 x 1 m, -27.1 m depth. Source leakage fluxes:  $3.8 \times 10^4$ ,  $3.8 \times 10^5$ ,  $3.8 \times 10^6 \text{ g m}^{-2}\text{d}^{-1}$
- **Fault** source geometry: 10 x 1000 m, -27.1 m depth. Source leakage fluxes: 3.8, 38,  $380 \text{ g m}^{-2}\text{d}^{-1}$

# Surface CO<sub>2</sub> Leakage Fluxes: Well Simulations



# Surface CO<sub>2</sub> Leakage Fluxes: Fault Simulations





$A_S$  = area of synthetic source

$A_T$  = area of model domain =  $10^6 \text{ m}^2$

$F_S$  = maximum leakage flux

$F_B$  = average background flux =  $8.7 \text{ g m}^{-2} \text{ d}^{-1}$

$$f_{ME} = \sqrt{(LR_I - LR_C)^2 / LR_I}$$